

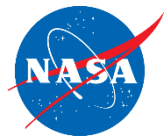


# Using Natural Language to Enhance Mission Effectiveness



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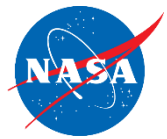
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# Outline

- Introduction and background
- Acceptance of using voice
- Intent inference

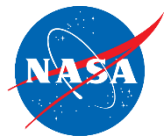




# Introduction & Background



- Current interaction with a drone requires the operator to understand the specifics of the controller and the drone's dynamic behavior
- Not a natural and higher level teaming relationship
  - Increased workload
  - Decreased situation awareness
  - Decreased trust
- Natural language may increase collaborative teaming



# Initial Voice Usability Experiment



MultiPkgDel\_Input

### Package Delivery Set Up

Quit

Always mouse/keyboard input

Predefined Package Code Check

Package Code:

☐ Exists  
☒ Does NOT Exist

Please fill in below

Delivery Location and Time

From:

To:

Return:

Delivery Time (hh:mm): ☒ Immediately ☐ Specified

Package Weight and Dimensions

Weight:  ☐ Too Heavy

Length (in):  ☐ Too Large

Width (in):  ☐ Too Large

Depth (in):  ☐ Too Large

Volume (in^3): 30

Total Size (in): 10

Options

Calculate Trajectory

☐ Good ☒ Error

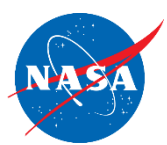
Commands

## Measured:

- Input correctness
- Input time
- Workload ratings
- Subjective ratings
- Subject comments

Options and commands were either voice or mouse/keyboard input

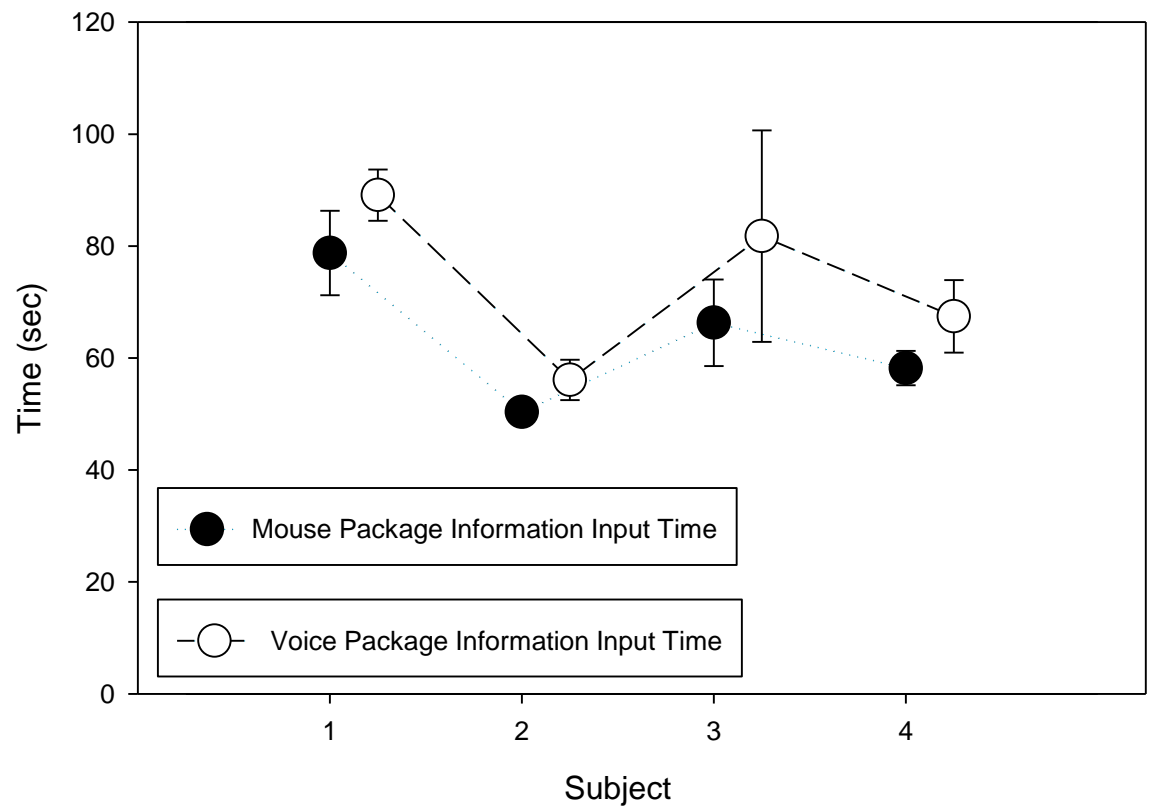
- CMU Sphinx4
- Defined dictionary



# Options Input Times

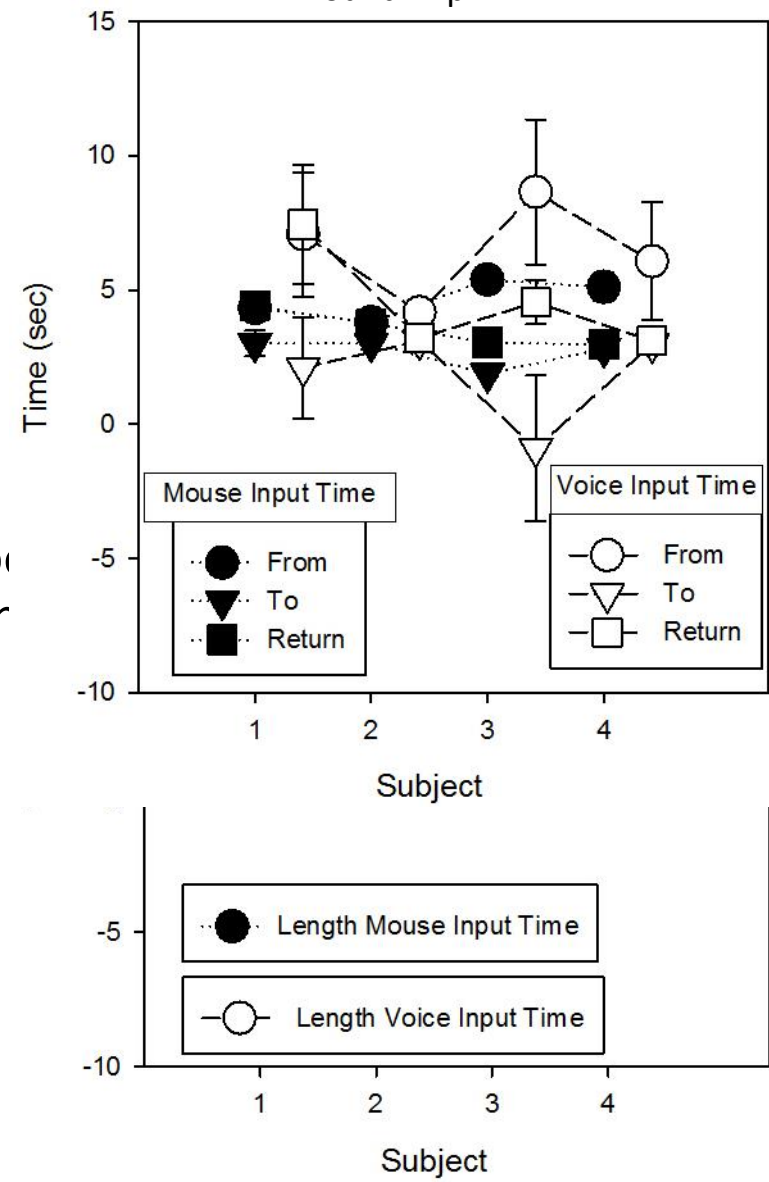


• Option voice input took slightly more time



• Sp  
lor

## Menu Option Input Time "Round Trip"



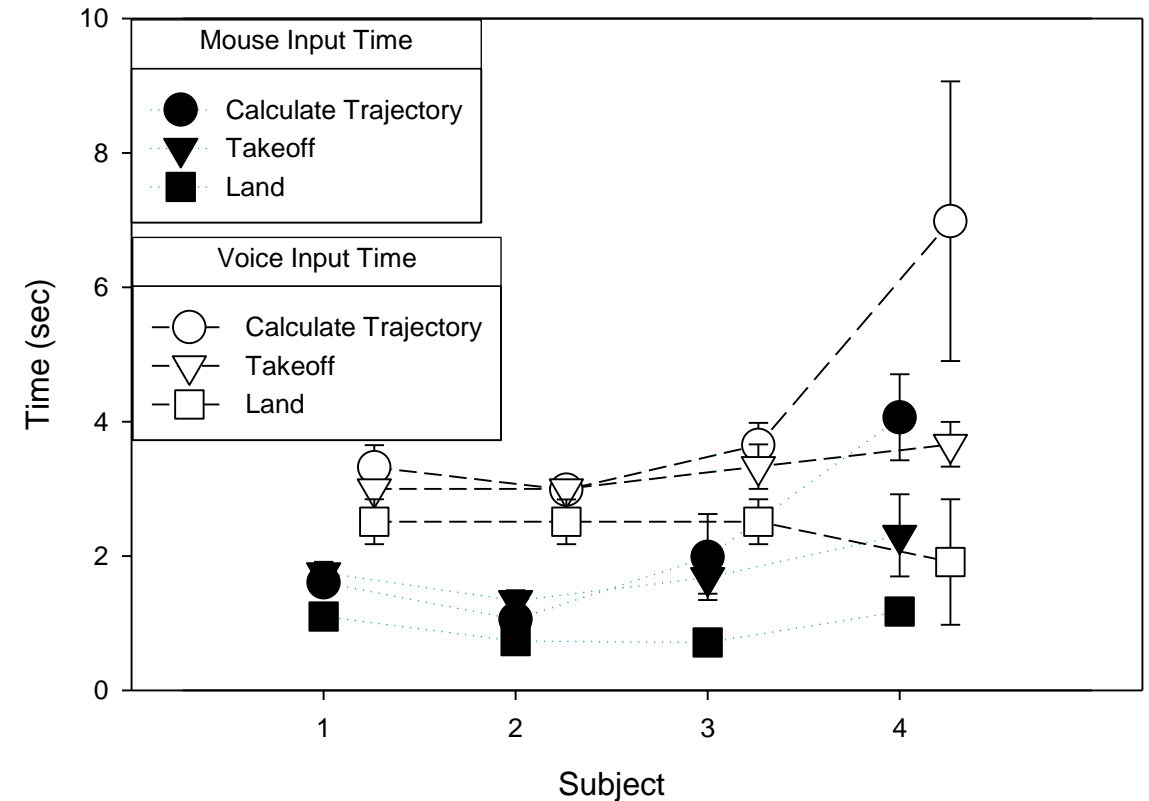
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erall times



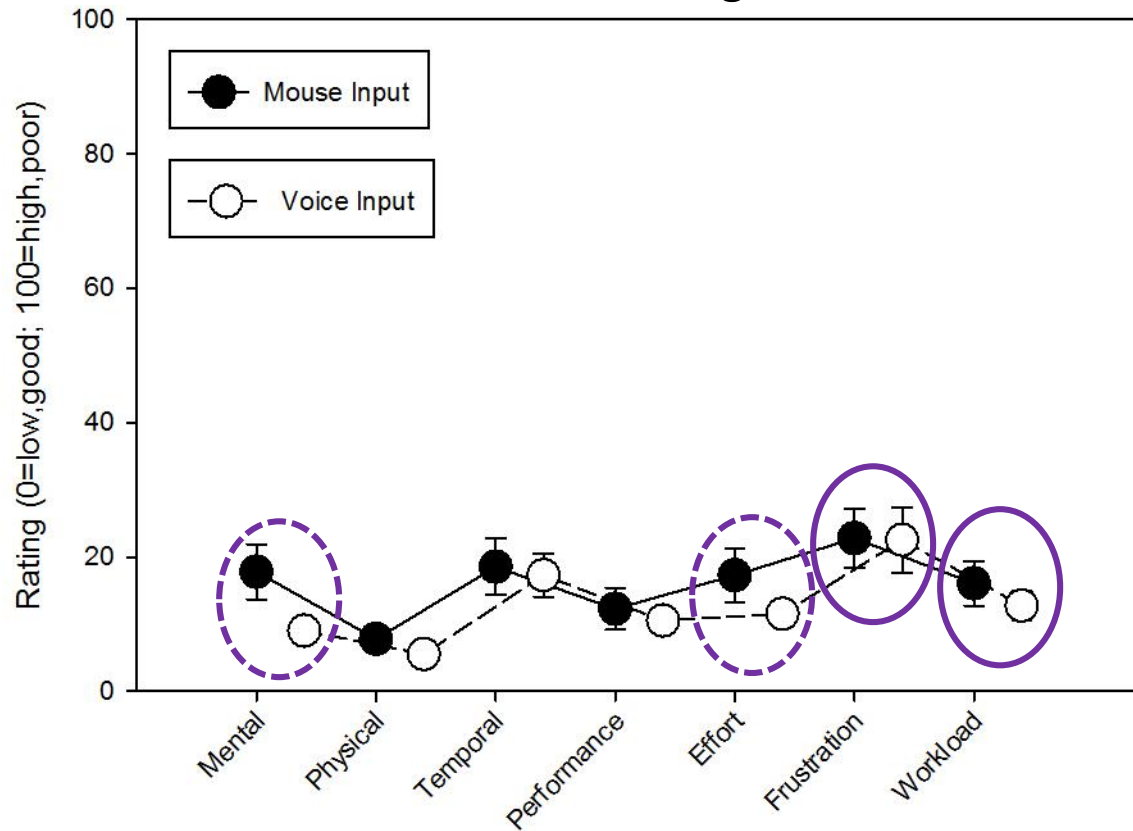
# Commands Input Times



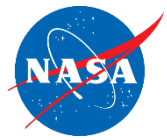
- *Command* voice input took longer than mouse input
  - Longer phrases took more time
- Use mouse or touch input for mission critical or safety related commands



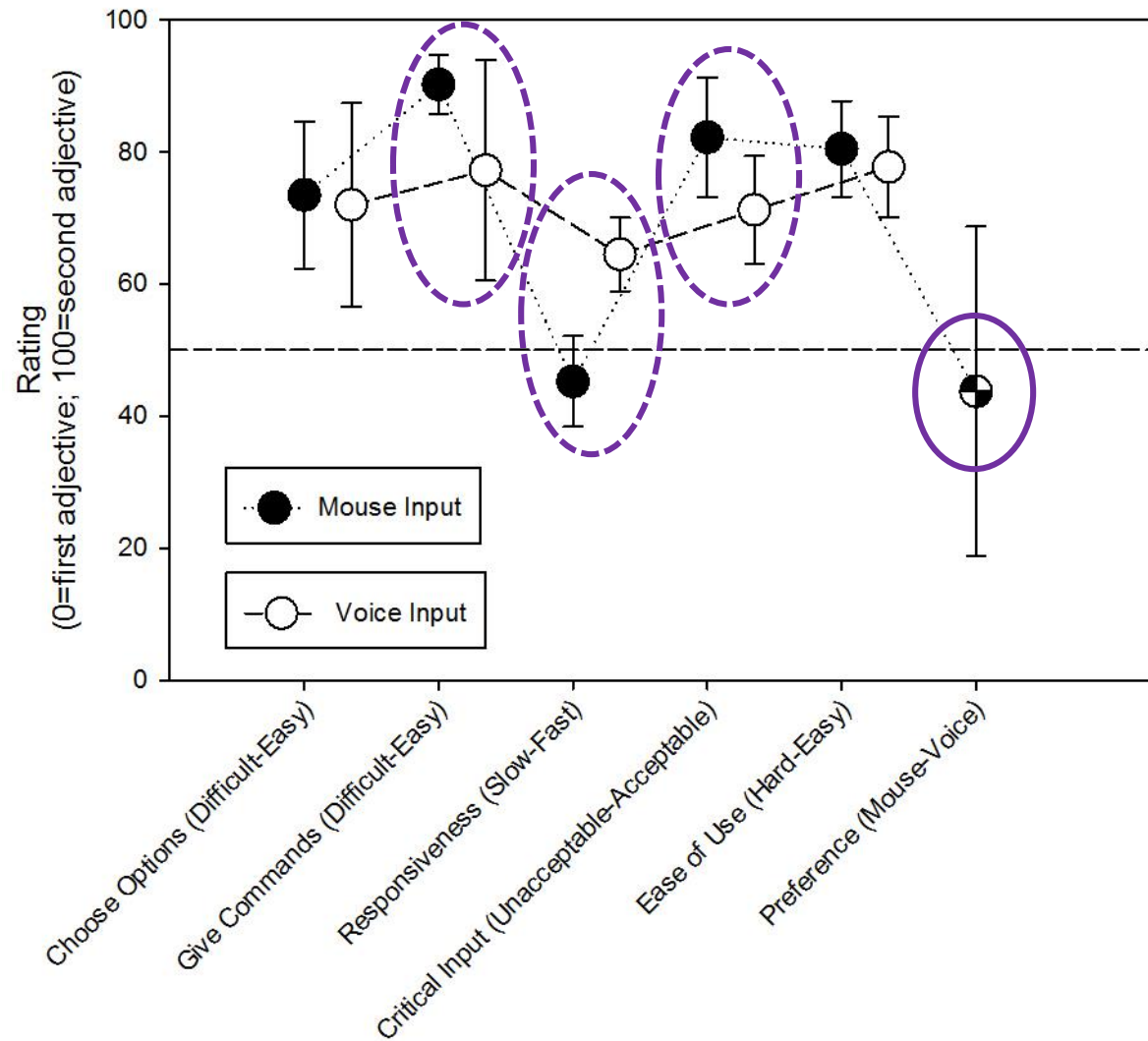
## NASA-TLX Ratings



- Voice input lower overall workload
  - Especially for:
    - Mental
    - Effort
- Frustration about equal
  - Time for voice command to register
  - No indication on screen until something changed that system was parsing voice command
    - Lacking intent information



# Subjective Ratings and Comments



- Slight overall preference for mouse input

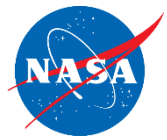
- Except for Responsiveness

- “Tedious to move the mouse around”

- Largest differences are for *Commands*

- Use mouse or touch input for mission critical or safety related commands





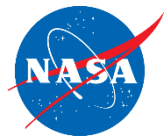
# Initial Voice Usability Experiment Summary



- Voice took longer to input information
  - Longer phrases took longer
- Voice has slightly lower workload
  - Frustration about equal with mouse input → No indication that voice system was working
- Subjective preferences indicated mouse input preference
  - Critical input commands had lowest preference in using voice input

- Voice input acceptable to non-critical input
- Mouse/keyboard/touchscreen preferred for critical input

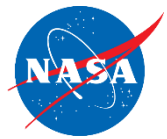
} Inferring *Commander's Intent* by machine  
may further increase teaming



# Predicting Commander's Intent



- Most users (of computers, autonomous systems, and technology in general) verbalize while working with machines
  - Especially true for members of teams with multiple humans
- Often verbalizations take the form of imprecise questions
  - “What’s it doing now?”
- Can we predict the *Commander's Intent* and provide desired information on UAV behavior based only on such simple verbal questions?



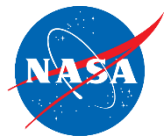
# Latent Semantic Analysis (LSA)



- Well-established tool in computational linguistics
- Determines the degree of semantic relationship between two pieces of language (documents, verbal utterances, etc.)

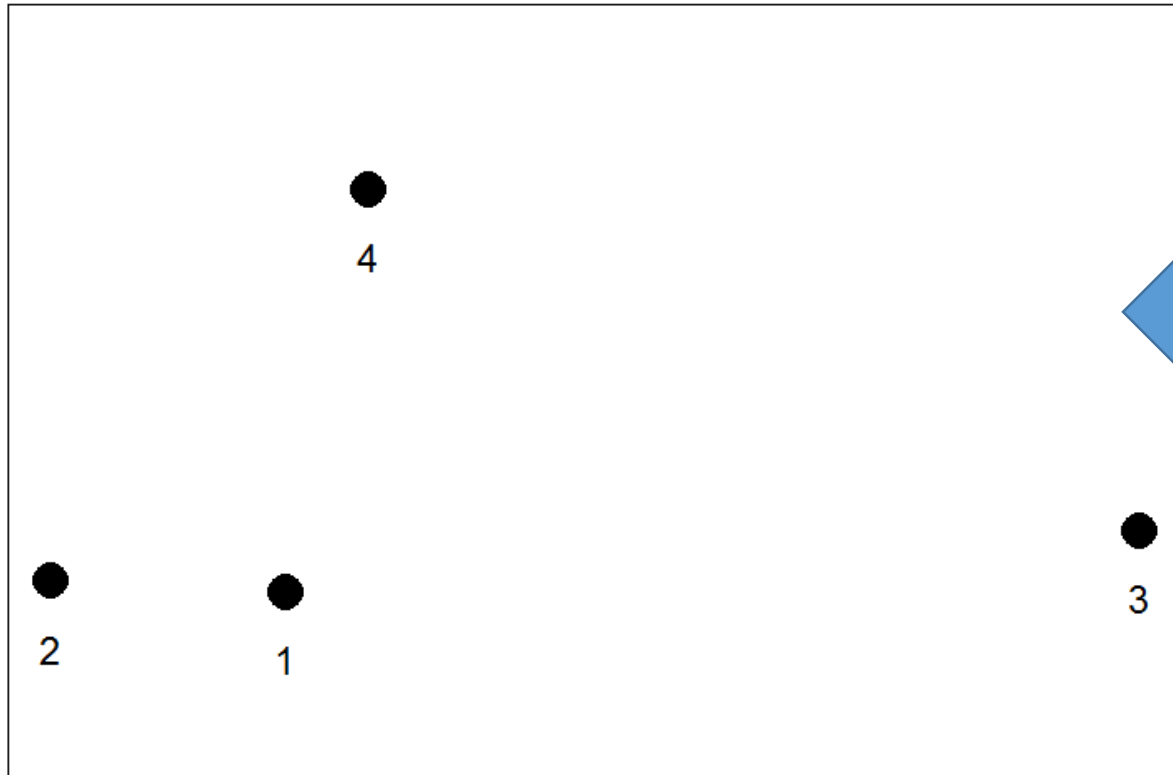
## Methodology:

- Create term-document matrix of all words and utterances in the corpus
- Decompose using singular value decomposition to produce a similarity matrix
- Use multidimensional scaling to plot these similarity values graphically
- The closer two documents are, the more closely semantically they are related

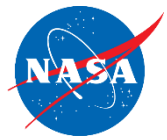


# LSA Example

- Utterance 1: "One fish two fish red fish blue fish"  
Utterance 2: "Black fish blue fish old fish new fish"  
Utterance 3: "This one has a little star this one has a little car"  
Utterance 4: "Say! What a lot of fish there are"



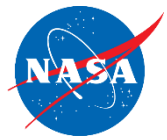
	U1	U2	U3	U4	
one		1	0	0	0
fish		4	4	0	1
two		1	0	0	0
red		1	0	0	0
blue		1	1	0	0
black		0	1	0	0
old		0	1	0	0
new		0	1	0	0
this		0	0	2	0
one		0	0	2	0
has		0	0	2	0
a		0	0	2	1
little		0	0	2	0
star		0	0	1	0
car		0	0	1	0
say		0	0	0	1
what		0	0	0	1
lot		0	0	0	1
of		0	0	0	1
there		0	0	0	1
are		0	0	0	1



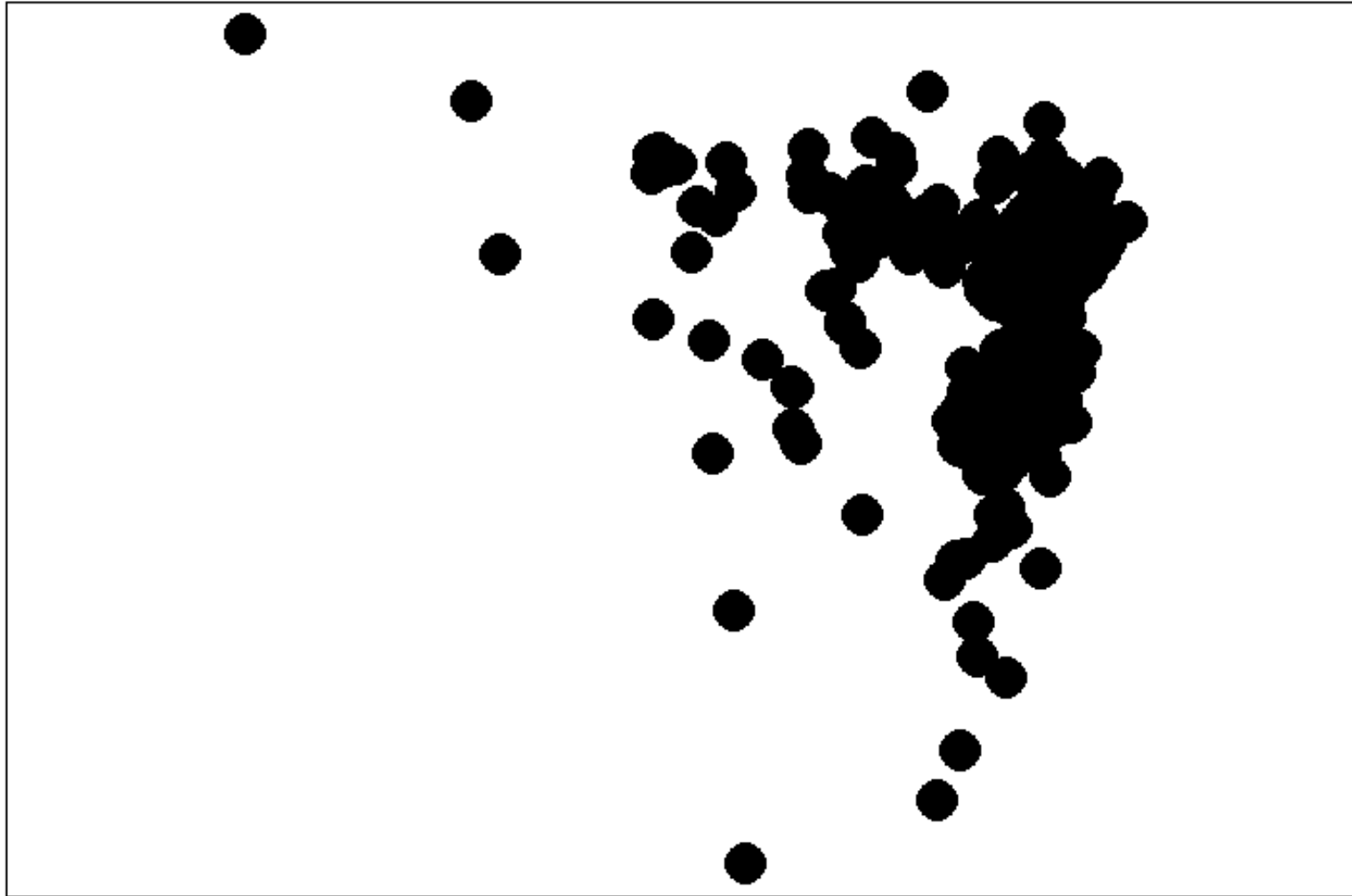
## Generating the Semantic Map

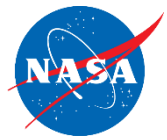


- Observed language used by human operators while working with UAVs at NASA Langley's Autonomy Incubator
- Analyzed data to produce a semantic map for UAV operation
  - A predefined semantic space enables better predictions
  - Semantic map can be continually trained
- LSA carried out in R Statistical Programming Language

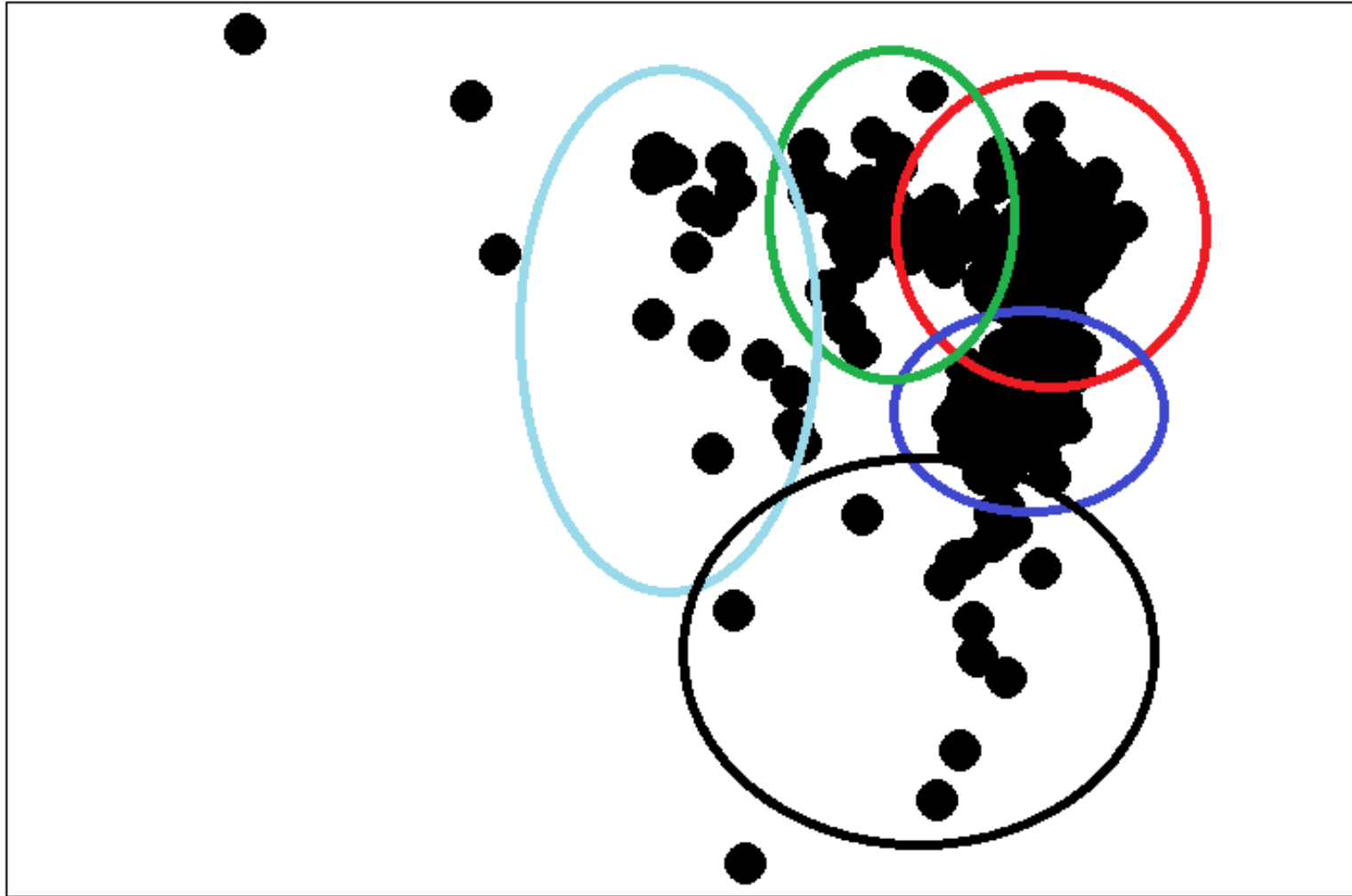


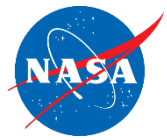
# Semantic Map of the Autonomy Incubator



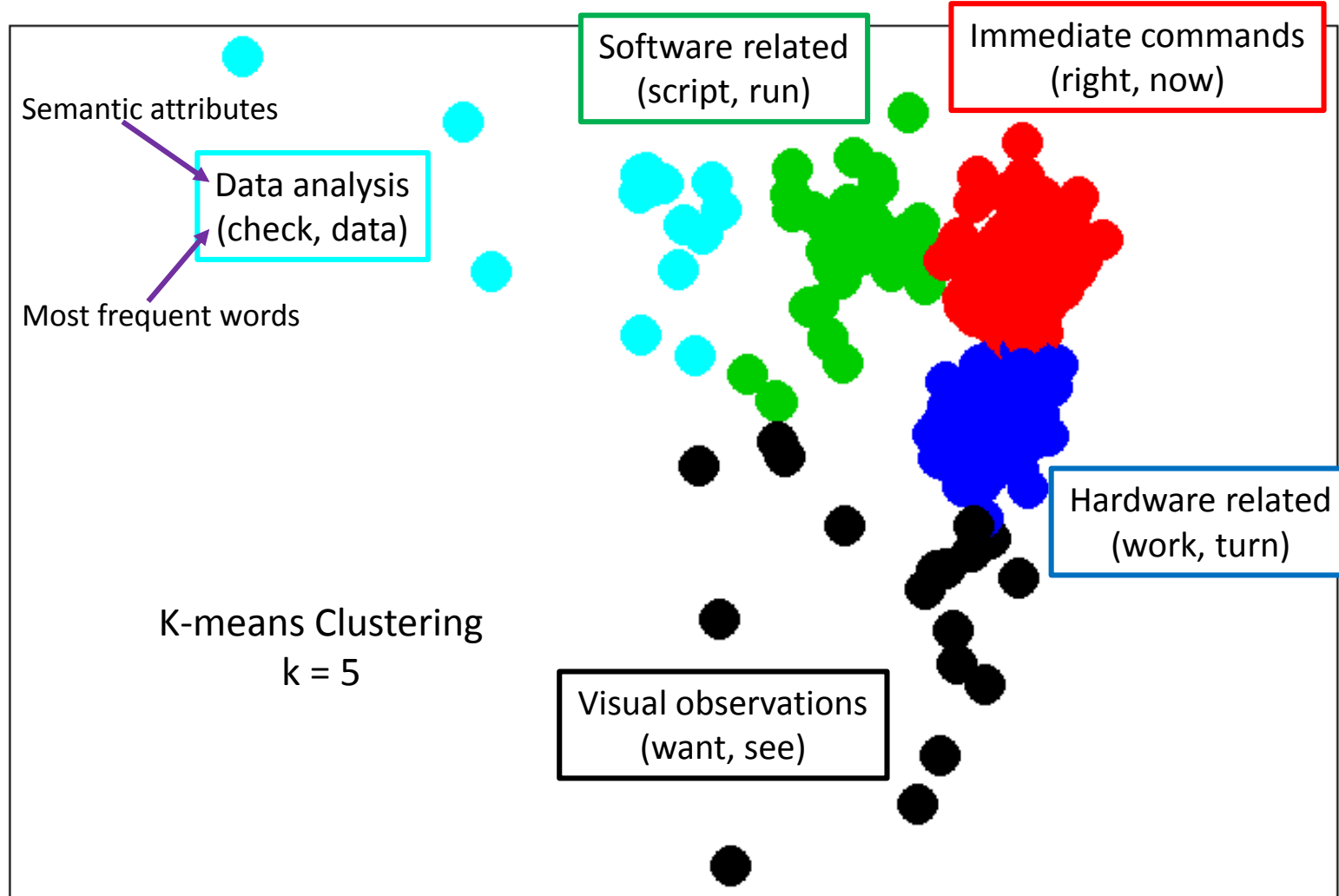


# Semantic Map of the Autonomy Incubator





# Semantic Map of the Autonomy Incubator



- Clusters on semantic map defined by different language
- New documents/utterances can be mapped to an existing semantic map
  - Semantic context of new utterance can be predicted based on which cluster is closest to newly mapped utterance
- Ability to predict semantic area of an utterance can be applied to prediction of the content area of questions
  - “What’s it doing now?”
- LSA allows for prediction of *Commander’s Intent* for UAV operation

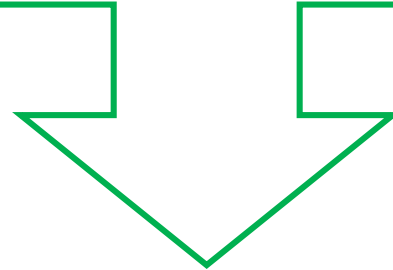




## Predicting Commander's Intent – Planned Research



1. User's verbal interactions with UAV transcribed using CMU Sphinx4
2. System triggered when the user asks a question
3. Question and immediate verbal context mapped to existing semantic map
4. Determine closest cluster to the newly mapped information
  - Information associated with this closest cluster provided to user
5. Correctly interpreted utterances added to existing semantic map to further define semantic sphere



- Autonomous agent able to answer back appropriately to the question *“What are you doing”*

Based on:

- Mission context
- Previous utterances